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A RANDOM NUMBER SENERATOR FOR CONTINUOUS RANDOM VARIABLES BASED--ETC(U)
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A RANDOM NUMBER GENERATOR FOR CONTINUOUS RANDOM VARIABLES
BASED ON AN INTERPOLATION PROCEDURE OF AKIMA

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ABSTRACT

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A Fortran-IV subroutine is given which may be used to generate random observations of a continuous random variable from a table of discrete observations. This subroutine employs Akima's algorithm for cubic spline interpolation.

The compatibility of problem and algorithm is such that this simple routine gives very good results.

1. The Algorithm. An important part of any simulation study is the sampling of a random variable x with cummulative distribution function F(x). Often F is specified only by a table of (x,F(x)), the probability distribution of the random variable y=F(x) is the uniform distribution U(0,1). There are satisfactory pseudorandom number generators to sample from U(0,1). For example from Knuth [2]

(1.1)  $y_{n+1} = 31415926y_n + 27182818 \pmod{2^{35}}$ .

The problem of sampling from F(x) may be looked at, then, as equivalent to finding an inversion formula

(1.2)  $x = F^{-1}(y)$ 

To approximate  $\mbox{ } \mbox{ } \mbo$ 

(1.3)  $\{(x_i,F(x_i)): x_1 < x_2 < ... < x_k\}$ 

plus a good interpolation routine. We should have in (1.3) that  $F(x_1) \sim 0$  and  $F(x_k) \sim 1$ . In this way it is possible to take random values from U(0,1) and obtain their approximate inverses as random samples from "nearly F(x)."

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The sampling problem now reduces to one of interpolation subject to a montonicity constraint or "isotone interpolation." Neither the standard polynomial interpolation nor the cubic spline interpolation have a chance of accomplishing this objective. For this reason (and others) the standard approach in the literature is piecewise linear interpolation. Observe that piecewise liner interpolation maintains monotonicity but, in general, at the expense of accuracy.

It is the purpose of this note merely to point out that Akima's [1] quasi-Hermite piecewise cubic interpolation should be very effective on this problem; since it was designed to handle similar problems. A random number generator (RNG) is advocated which uses Akima interpolation. The user reads in

 $\{(x_{(1)},F(x_{(1)})):x_{(0)}< x_{(1)}< \ldots < x_{(k)}< x_{(k+1)}\}.$ 

The routine then computes and stores the coefficients of  $x=F^{-1}(y)$ . Calls on the random number generator will first obtain a pseudorandom number y from U(0,1). If  $y \le F(x_{(1)})$ , the random number given is  $x_{(1)}$ , if  $y \ge F(x_{(k)})$ , the random number given is  $x_{(k)}$ . If  $F(x_{(1)} < y < F(x_{(k)})$ , the random number given

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is F<sup>-1</sup>(y). A listing of the random number generator is given in Appendix II.

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Naturally, the quality of the random number generator proposed is determined by the ability of  $\mathbf{F}^{-1}$  to approximate a variety of cumulative distribution functions. In Appendix I, we show how the interpolation errors of  $\mathbf{F}^{-1}(\mathbf{y})$  compare with those of linear interpolation in the case of the standard normal, Cauchy and double exponential distributions with location 0 and scale 1. Exact values of  $\mathbf{F}^{-1}(\mathbf{y})$  are assumed given for  $\mathbf{y}$  between .50 and .98 in increments of .01 and for  $\mathbf{y}$  between .98 and .995 in increments of .005. Interpolated values of  $\mathbf{F}^{-1}$  and linear interpolation are obtained at points between the mesh values and the relative errors computed and compared.

### REFERENCES

- Akima, H., A new method of interpolation and smooth curve fitting based on local procedures, <u>J. ACM</u>, 17(1970), 589-602.
- Knuth, Donald E., <u>Seminumerical Algo-rithms</u>, Addison-Wesley, Reading, Mass., 1969.

# APPENDIX I

# NORMAL DISTRIBUTION

# STRIBUTION DOUBLE EXP DISTRIBUTION

F(x) =

0.50333

0,52333

0.54333

0.56333

0.58333

0.60333

0.62333

0.64333

0.66333

0.68333

0.70333

0.72333

0.74333

0.76333

0.78333

0.80333

0.82333

0.84333

0.86333

0.88333

0.90333

0.92333

0.94333

0.96333

0.98333

0.99333

0.52333         0.05837         0.00003         0.00020         0.52333         2.           0.54333         0.10858         0.00002         0.00033         0.54333         2.           0.56333         0.15910         0.00006         0.00044         0.56333         2.           0.58333         0.21005         0.00004         0.00061         0.58333         2.           0.60333         0.26157         0.00001         0.00080         0.60333         2.           0.62333         0.31381         0.00001         0.00096         0.62333         2.           0.64333         0.36694         0.00000         0.00114         0.64333         3.           0.66333         0.42114         0.00004         0.00129         0.66333         3.           0.68303         0.47662         0.00005         0.00149         0.68333         3.           0.70333         0.53362         0.00004         0.00172         0.70333         3.           0.72333         0.59241         0.00002         0.00200         0.72333         3.           0.76333         0.71680         0.00007         0.00258         0.76333         4.           0.78333         0.78334         0.000	E (AKIMAS) = E (LINEAR)  .09951
0.52333         0.05837         0.00003         0.00020         0.52333         2.           0.54333         0.10858         0.00002         0.00033         0.54333         2.           0.56333         0.15910         0.00006         0.00044         0.56333         2.           0.58333         0.21005         0.00004         0.00061         0.58333         2.           0.60333         0.26157         0.00001         0.00080         0.60333         2.           0.62333         0.31381         0.00001         0.00096         0.62333         2.           0.64333         0.36694         0.00000         0.00114         0.64333         3.           0.66333         0.42114         0.00004         0.00129         0.66333         3.           0.68303         0.47662         0.00005         0.00149         0.68333         3.           0.70333         0.53362         0.00004         0.00172         0.70333         3.           0.74333         0.59241         0.00002         0.00200         0.72333         3.           0.76333         0.71680         0.00007         0.00258         0.76333         4.           0.78333         0.78329         0.000	.22281 0.00003 0.00233 .35140 0.00002 0.00244 .48575 0.00002 0.00255 .62641 0.00002 0.00268 .77398 0.00003 0.00281 .92918 0.00003 0.00295 .09286 0.00004 0.00312 .26599 0.00003 0.00331 .44972 0.00004 0.00351 .67544 0.00005 0.00375 .85483 0.00006 0.00402
0.54333         0.10858         0.00002         0.00033         0.54333         2.           0.56333         0.15910         0.00006         0.00044         0.56333         2.           0.58333         0.21005         0.00004         0.00061         0.58333         2.           0.60333         0.26157         0.00001         0.00096         0.62333         2.           0.62333         0.31381         0.00001         0.00096         0.62333         2.           0.64333         0.36694         0.00000         0.00114         0.64333         3.           0.66333         0.42114         0.00004         0.00129         0.66333         3.           0.68323         0.47662         0.00005         0.00149         0.68333         3.           0.70333         0.53362         0.00004         0.00172         0.70333         3.           0.74333         0.59241         0.00002         0.00200         0.72333         3.           0.76333         0.71680         0.00007         0.00258         0.76333         4.           0.78333         0.78333         0.78329         0.00004         0.00300         0.78333         4.           0.80333         0.853	.35140 0.00002 0.00244 .48575 0.00002 0.00255 .62641 0.00002 0.00268 .77398 0.00003 0.00281 .92918 0.00003 0.00295 .09286 0.00004 0.00312 .26599 0.00003 0.00331 .44972 0.00004 0.00351 .67544 0.00005 0.00375 .85483 0.00006 0.00402
0.56333         0.15910         0.00006         0.00044         0.56333         2.           0.58333         0.21005         0.00004         0.00061         0.58333         2.           0.60333         0.26157         0.00001         0.00080         0.60333         2.           0.62333         0.31381         0.00001         0.00096         0.62333         2.           0.64333         0.36694         0.00000         0.00114         0.64333         3.           0.66333         0.42114         0.00004         0.00129         0.66333         3.           0.70333         0.47662         0.00005         0.00149         0.68333         3.           0.70333         0.53362         0.00004         0.00172         0.70333         3.           0.72333         0.59241         0.00002         0.00200         0.72333         3.           0.76333         0.71680         0.00007         0.00258         0.76333         4.           0.78333         0.78329         0.00004         0.00300         0.78333         4.           0.80333         0.85343         0.00005         0.00346         0.80333         4.           0.82333         0.92805         0.000	.48775 0.00002 0.00255 .62641 0.00002 0.00268 .77398 0.00003 0.00281 .92918 0.00003 0.00295 .09286 0.00004 0.00312 .26599 0.00003 0.00331 .44972 0.00004 0.00351 .67544 0.00005 0.00375
0.56333         0.15910         0.00006         0.00044         0.56333         2.           0.58333         0.21005         0.00004         0.00061         0.58333         2.           0.60333         0.26157         0.00001         0.00080         0.60333         2.           0.62333         0.31381         0.00001         0.00096         0.62333         2.           0.64333         0.36694         0.00000         0.00114         0.64333         3.           0.66333         0.42114         0.00004         0.00129         0.66333         3.           0.68323         0.47662         0.00005         0.00149         0.68333         3.           0.70333         0.53362         0.00004         0.00172         0.70333         3.           0.72333         0.59241         0.00002         0.00200         0.72333         3.           0.76333         0.71680         0.00000         0.00231         0.74333         4.           0.78333         0.78329         0.00004         0.00300         0.78333         4.           0.80333         0.85343         0.00005         0.00346         0.80333         4.           0.82333         0.92805         0.000	.62641 0.00002 0.00268 .77398 0.00003 0.00281 .92918 0.00003 0.00295 .09286 0.00004 0.00312 .26599 0.00003 0.00351 .44972 0.00004 0.00351 .67544 0.00005 0.00375
0.58333         0.21005         0.00004         0.00061         0.58333         2.           0.60333         0.26157         0.00001         0.00080         0.60333         2.           0.62333         0.31381         0.00001         0.00096         0.62333         2.           0.64333         0.36694         0.00000         0.00114         0.64333         3.           0.66333         0.42114         0.00004         0.00129         0.66333         3.           0.70333         0.47662         0.00005         0.00149         0.68333         3.           0.70333         0.53362         0.00004         0.00172         0.70333         3.           0.72333         0.59241         0.00002         0.00200         0.72333         3.           0.76333         0.65334         0.00000         0.00231         0.74333         4.           0.78333         0.71680         0.00007         0.00258         0.76333         4.           0.78333         0.78329         0.00004         0.00300         0.78333         4.           0.80333         0.85343         0.00005         0.00346         0.80333         4.           0.82333         0.92805         0.000	.77398 0.00003 0.00281 .92918 0.00003 0.00295 .09286 0.00004 0.00312 .26599 0.00003 0.00351 .44972 0.00004 0.00351 .66544 0.00005 0.00375
0.60333         0.26157         0.00001         0.00080         0.60333         2.           0.62333         0.31381         0.00001         0.00096         0.62333         2.           0.64333         0.36694         0.00000         0.00114         0.64333         3.           0.66333         0.42114         0.00004         0.00129         0.66333         3.           0.68333         0.47662         0.00005         0.00149         0.68333         3.           0.70333         0.53362         0.00004         0.00172         0.70333         3.           0.72333         0.59241         0.00002         0.00200         0.72333         3.           0.74333         0.65334         0.00000         0.00231         0.74333         4.           0.76333         0.71680         0.00007         0.00258         0.76333         4.           0.78333         0.78329         0.00004         0.00300         0.78333         4.           0.80333         0.85343         0.00005         0.00346         0.80333         4.           0.82333         0.92805         0.00007         0.00401         0.82333         5.	.92918         0.00003         0.00295           .09286         0.00004         0.00312           .26599         0.00003         0.00331           .44972         0.00004         0.00351           .6′544         0.00005         0.00375           .85483         0.00006         0.00402
0.62333         0.31381         0.00001         0.00096         0.62333         2.           0.64333         0.36694         0.00000         0.00114         0.64333         3.           0.66333         0.42114         0.00004         0.00129         0.66333         3.           0.68333         0.47662         0.00005         0.00149         0.68333         3.           0.70333         0.53362         0.00004         0.00172         0.70333         3.           0.72333         0.59241         0.00002         0.00200         0.72333         3.           0.74333         0.65334         0.00000         0.00231         0.74333         4.           0.76333         0.71680         0.00007         0.00258         0.76333         4.           0.78333         0.78329         0.00004         0.00300         0.78333         4.           0.80333         0.85343         0.00005         0.00346         0.80333         4.           0.82333         0.92805         0.00007         0.00401         0.82333         5.	.09286 0.00004 0.00312 .26599 0.00003 0.00331 .44972 0.00004 0.00351 .6′544 0.00005 0.00375 .85483 0.00006 0.00402
0.64333       0.36694       0.00000       0.00114       0.64333       3.         0.66333       0.42114       0.00004       0.00129       0.66333       3.         0.68333       0.47662       0.00005       0.00149       0.68333       3.         0.70333       0.53362       0.00004       0,00172       0.70333       3.         0.72333       0.59241       0.00002       0.00200       0.72333       3.         0.74333       0.65334       0.00000       0.00231       0.74333       4.         0.76333       0.71680       0.00007       0.00258       0.76333       4.         0.78333       0.78329       0.00004       0.00300       0.78333       4.         0.80333       0.85343       0.00005       0.00346       0.80333       4.         0.82333       0.92805       0.00007       0.00401       0.82333       5.	.26599 0.00003 0.00331 .44972 0.00004 0.00351 .6′544 0.00005 0.00375 .85483 0.00006 0.00402
0.66333       0.42114       0.00004       0.00129       0.66333       3.         0.68333       0.47662       0.00005       0.00149       0.68333       3.         0.70333       0.53362       0.00004       0.00172       0.70333       3.         0.72333       0.59241       0.00002       0.00200       0.72333       3.         0.74333       0.65334       0.00000       0.00231       0.74333       4.         0.76333       0.71680       0.00007       0.00258       0.76333       4.         0.78333       0.78329       0.00004       0.00300       0.78333       4.         0.80333       0.85343       0.00005       0.00346       0.80333       4.         0.82333       0.92805       0.00007       0.00401       0.82333       5.	.44972 0.00004 0.00351 .6′544 0.00005 0.00375 .85483 0.00006 0.00402
0.68323       0.47662       0.00005       0.00149       0.68333       3.         0.70333       0.53362       0.00004       0.00172       0.70333       3.         0.72333       0.59241       0.00002       0.00200       0.72333       3.         0.74333       0.65334       0.00000       0.00231       0.74333       4.         0.76333       0.71680       0.00007       0.00258       0.76333       4.         0.78333       0.78329       0.00004       0.00300       0.78333       4.         0.80333       0.85343       0.00005       0.00346       0.80333       4.         0.82333       0.92805       0.00007       0.00401       0.82333       5.	.6/544 0.00005 0.00375 .85483 0.00006 0.00402
0.70333     0.53362     0.00004     0.00172     0.70333     3.       0.72333     0.59241     0.00002     0.00200     0.72333     3.       0.74333     0.65334     0.00000     0.00231     0.74333     4.       0.76333     0.71680     0.00007     0.00258     0.76333     4.       0.78333     0.78329     0.00004     0.00300     0.78333     4.       0.80333     0.85343     0.00005     0.00346     0.80333     4.       0.82333     0.92805     0.00007     0.00401     0.82333     5.	.85483 0.00006 0.00402
0.72333     0.59241     0.00002     0.00200     0.72333     3       0.74333     0.65334     0.00000     0.00231     0.74333     4       0.76333     0.71680     0.00007     0.00258     0.76333     4       0.78333     0.78329     0.00004     0.00300     0.78333     4       0.80333     0.85343     0.00005     0.00346     0.80333     4       0.82333     0.92805     0.00007     0.00401     0.82333     5	
0.74333       0.65334       0.00000       0.00231       0.74333       4.         0.76333       0.71680       0.00007       0.00258       0.76333       4.         0.78333       0.78329       0.00004       0.00300       0.78333       4.         0.80333       0.85343       0.00005       0.00346       0.80333       4.         0.82333       0.92805       0.00007       0.00401       0.82333       5.	
0.76333     0.71680     0.00007     0.00258     0.76333     4       0.78333     0.78329     0.00004     0.00300     0.78333     4       0.80333     0.85343     0.00005     0.00346     0.80333     4       0.82333     0.92805     0.00007     0.00401     0.82333     5	
0.78333     0.78329     0.00004     0.00300     0.78333     4       0.80333     0.85343     0.00005     0.00346     0.80333     4       0.82333     0.92805     0.00007     0.00401     0.82333     5	.32331 0.00007 0.00471
0.80333         0.85343         0.00005         0.00346         0.80333         4           0.82333         0.92805         0.00007         0.00401         0.82333         5	.58819 0.00009 0.00514
0.82333 0.92805 0.00007 0.00401 0.82333 5.	.87874 0.00010 0.00567
	0.00013 0.00631
	0.56091 0.00015 0.00712
	0.97063 0.00019 0.00817
	5.44530 0.00024 0.00957
	0.00946 0.00031 0.01157
	7.70487 0.00040 0.01461
	3.61171 0.00042 0.01983
	0.91767 0.00215 0.03088
	2.28305 0.00450 0.03291
	0.03195 0.02895 0.00170

CAUCHY DISTRIBUTION

0.01047

0.07344

0.13698

0.20164

0.26795

0.33654

0.40809

0.48342

0.56347

0.64941

0.74267

0.84507

0.95897

1.08749

1.23490

1.40714

1.61283

1.86499

2.18419

2.60509

3.19100

4.07127

5.55776

8.64274

19.08113

47.73947

E(AKIMAS)=

0.00002

0.00005

0.00005

0.00005

0.00005

0.00006

0.00006

0.00007

0.00008

0.00009

0.00011

0.00013

0.00015

0.00017

0.00021

0.00025

0.00030

0.00037

0.00046

0.00057

0.00068

0.00072

0.00021

0.00113

0.02053

0.08864

E(LINEAR)=

0.00010

0.00054

0.00098

0.00143

0.00190

0.00237

0.00287

0.00340

0.00396

0.00456

0.00521

0.00592

0.00672

0.00761

0.00865

0.00985

0.01128

0.01304

0.01526

0.01820

0.02229

0.02844

0.03882

0.06036

0.06658

0.16661

### APPENDIX II

```
COMMON N.P1(50), P2(50), P3(50), P4(50), X(50)

CN IS THE NUMBER OF INTERPOLATING KNOTS. N SHOULD BE LESS OR EO TO
 N = 50
CALL INIT
C M IS THE NUMBER OF RANDOM NUMBERS TO BE GENFRATED M SMALLER THAN
           M = 20
CALL RNG(M)
CALL EXIT
            END
            SUBROUTINE INIT
 C THIS SUBROUTINE GENCHATES THE PARAMETERS OF THE CUBICS THAT

INTERPOLATE THE DATA MADES
         INTERPOLATE THE DATA KNOTS
ARRAYS PL.P2.P3.P4 CONTAIN THE PARAMETERS
            COMMON N.P1(50).P2(50).P3(50).P4(50).X(50)
FORMAT (2F12.6)
FORMAT (2X.10F12.6)
 200
 C ****** READ DATA ******************************

READ 100.((X(I).P4(I)).I=1.N)

C ******** READ DATA FINISHES **********
            N2 = N-2
S1=(P4(2)-P4(1))/(x(2)-x(1))
S2=(P4(3)-P4(2))/(x(3)-x(2))
            $3=(P4(3)-P4(4))/(X(3)-X(4))
DO 10 1=3.N2
            S4 = (P4(1+2) -P4(1+1))/(X(1+2) - X(1+1))
W1 = ABS(S2-S1)
            #1 = A05(54-53)

#7 (414#3) 20.30.20

P3(1) = (#3*52 + #1*53)/(#1+#3)

G0 T0 40
 20
             P3(1) = .5+(52+53)
 30
           P3(1) = .5*(52+53)

$1 = $2

$2 = $3

$3 = $4

00 60 1=3.n2

A=-X(1+1) - X(1)

P1(1) = (P3(1) + P3(1+1) - 2.0*(P4(1+1) - P4(1))/A)/(A*A)

P2(1)=(3.0*(P4(1+1)-P4(1)) /A - 2.0*P3(1) - P3(1+1))/A
 40
 10
            CONTINUE
RETURN
60
      134 = (pmin(134,135))

PRINT 100.1.RN([)

IF (RN([).LE.X(3)) RN([) = X(3)

IF (RN([).GE.X(N-2)) RN([)= X(N-2)

IC = 1

N3 = N-3
   10
        N3 = N-3

O0 20 1 =3.N3

O0 30 J=1:M

y = RN(J) - X(1)

IF (RN(J)-X(1)) 40.50.50

IF (RN(J)-X(1)) 60.60.40

YRN = P1(1) *Veyev + P2(1) *Veyev + P3(1) *V + P4(1)

YRN IS THE GENERATED RANDOM OBSERVATION

BELLIN 100.15.00.11. AND.
              PRINT 100.1C.RN(J).YRN
               IC = IC + I
   40
               IF (IC.GT.M) GO TO 9
              CONTINUE
               RETURN.
END
```

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# DATE FILMED

DTIC